

# Updates to OCO-2 $X_{CO_2}$ , data products, new science, and future perspectives

**David Crisp (JPL)**  
*and*

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December 13, 2018



# Background

- XCO<sub>2</sub> from space has been consistently refined over the last 10+ years
- Errors and biases of several ppm have been reduced to consistently less than 1 ppm.
- Important science is (and can be) done with these error levels, though further reductions are still highly desirable!

## MILESTONES



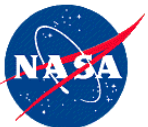
### GOSAT 2009-present

- ACOS versions 2.8, 2.9, 2.10, 3.3, 3.5, 7.3
- Many other retrievals as well; strong intercomparison efforts
- Random errors ~1ppm; biases ~ 0.6 ppm



### OCO-2 2014-present

- ACOS versions 7, 8, 9
- Some intercomparisons
- Random errors ~0.5 ppm; biases ~ 0.8 ppm



# B8 Successes

- Removed “southern ocean” bias due to addition of a stratospheric aerosol term in the retrieval
  - This mitigated effects from both real UT/LS aerosols, PLUS icing effects on the O2A band detector.
- Systematic errors significant reduced relative to B7.
- Agreement between land nadir, land glint, and ocean improved.

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<https://doi.org/10.5194/amt-11-1-2018>  
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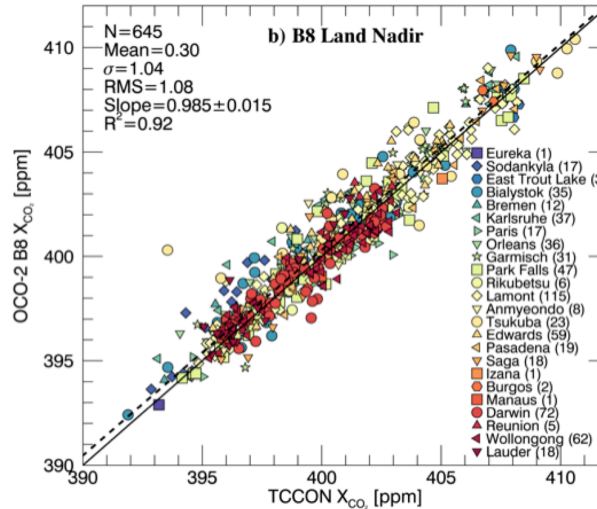
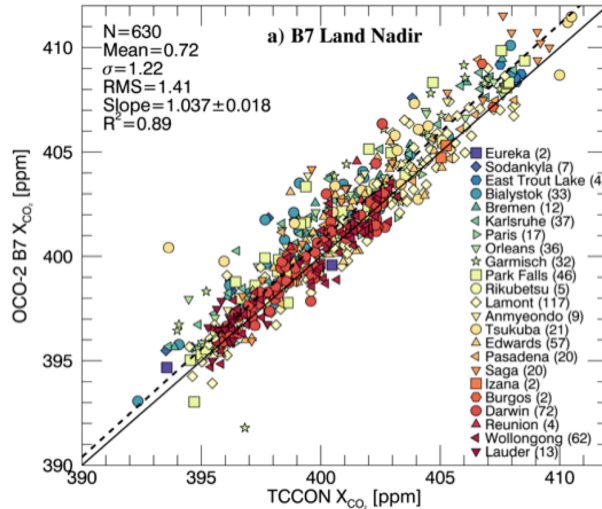
Atmospheric  
Measurement  
Techniques  
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EGU

## Improved retrievals of carbon dioxide from Orbiting Carbon Observatory-2 with the version 8 ACOS algorithm

Christopher W. O'Dell<sup>1</sup>, Annmarie Eldering<sup>2</sup>, Paul O. Wennberg<sup>3</sup>, David Crisp<sup>2</sup>, Michael R. Gunson<sup>2</sup>, Brendan Fisher<sup>2</sup>, Christian Frankenberg<sup>3</sup>, Matthäus Kiel<sup>3</sup>, Hannakaisa Lindqvist<sup>4</sup>, Lukas Mandrake<sup>2</sup>, Aronne Merrelli<sup>5</sup>, Vijay Natraj<sup>2</sup>, Robert R. Nelson<sup>1</sup>, Gregory B. Osterman<sup>2</sup>, Vivienne H. Payne<sup>2</sup>, Thomas E. Taylor<sup>1</sup>, Debra Wunch<sup>6</sup>, Brian J. Drouin<sup>2</sup>, Fabiano Oyafuso<sup>2</sup>, Albert Chang<sup>2</sup>, James McDuffie<sup>2</sup>, Michael Smyth<sup>2</sup>, David F. Baker<sup>1</sup>, Sourish Basu<sup>7,8</sup>, Frédéric Chevallier<sup>9</sup>, Sean M. R. Crowell<sup>10</sup>, Liang Feng<sup>11,12</sup>, Paul I. Palmer<sup>11,12</sup>, Mavendra Dubey<sup>13</sup>, Omaira E. García<sup>14</sup>, David W. T. Griffith<sup>15</sup>, Frank Hase<sup>16</sup>, Laura T. Iraci<sup>17</sup>, Rigel Kivi<sup>18</sup>, Isamu Morino<sup>19</sup>, Justus Notholt<sup>20</sup>, Hirofumi Ohyama<sup>19</sup>, Christof Petri<sup>20</sup>, Coleen M. Roehl<sup>3</sup>, Mahesh K. Sha<sup>21</sup>, Kimberly Strong<sup>6</sup>, Ralf Sussmann<sup>22</sup>, Yao Te<sup>23</sup>, Osamu Uchino<sup>19</sup>, and Voltaire A. Velasco<sup>15</sup>

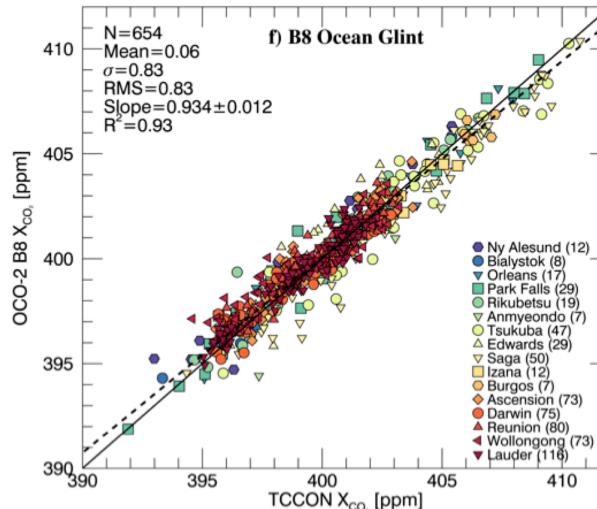
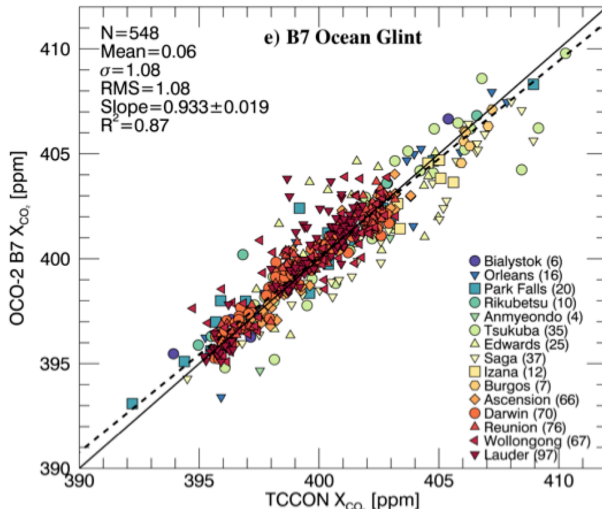


# B8 reduced XCO<sub>2</sub> errors vs. TCCON



Land (Nadir)

*25% Reduction in  
Error Variance*

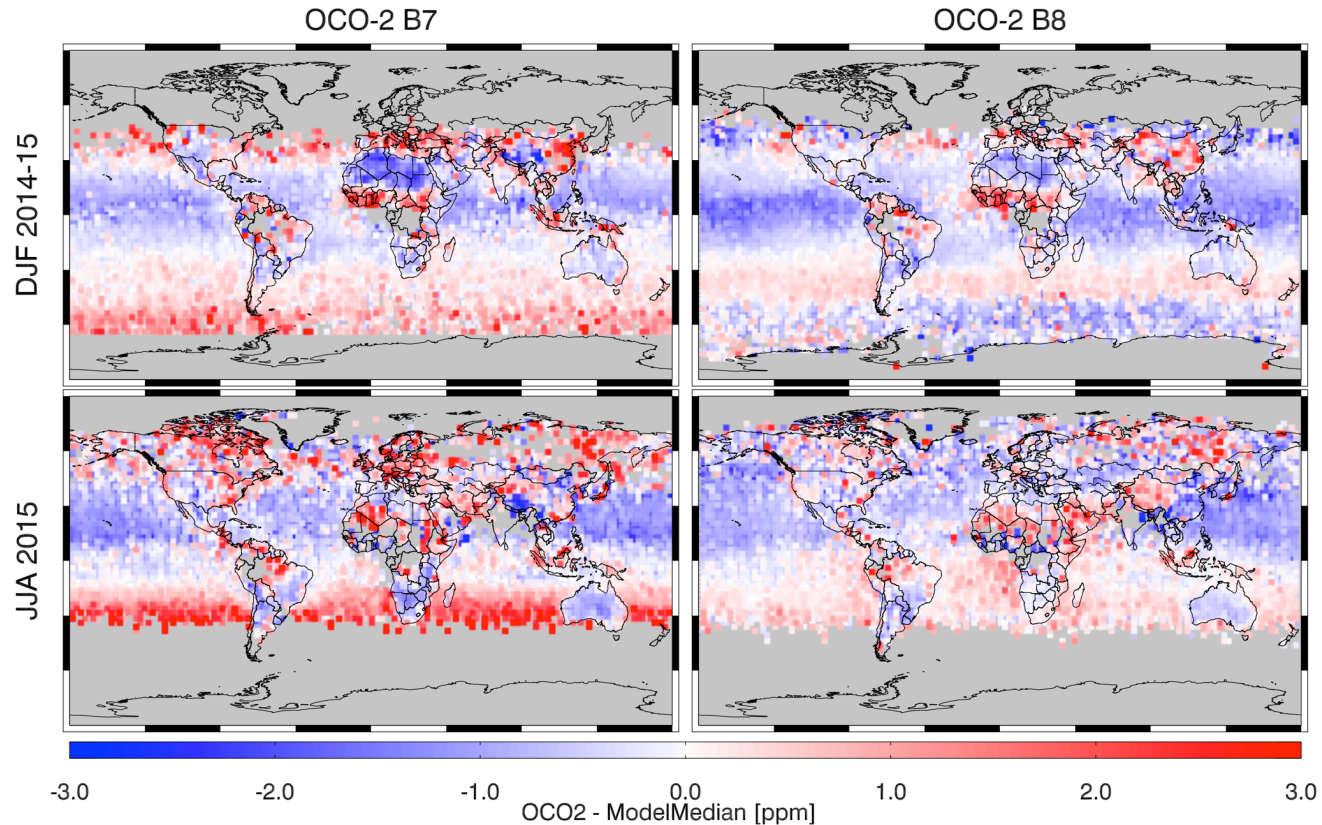


Ocean (Glint)

*40% Reduction in  
Error Variance*



# B8 reduced XCO<sub>2</sub> errors vs. Models

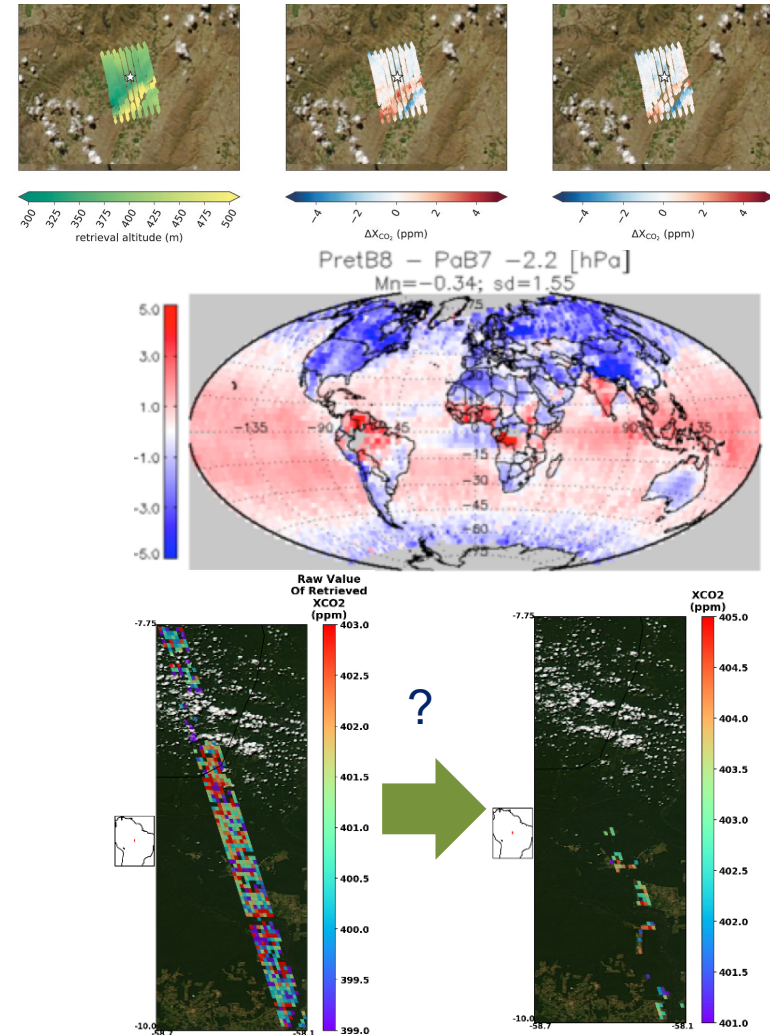


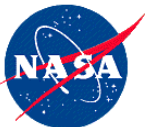
- Comparison to ensemble median of 9 models where they agree.
- Bias patterns significantly reduced
- Ocean coverage at higher SZAs extended
- Some important differences to the model median remain



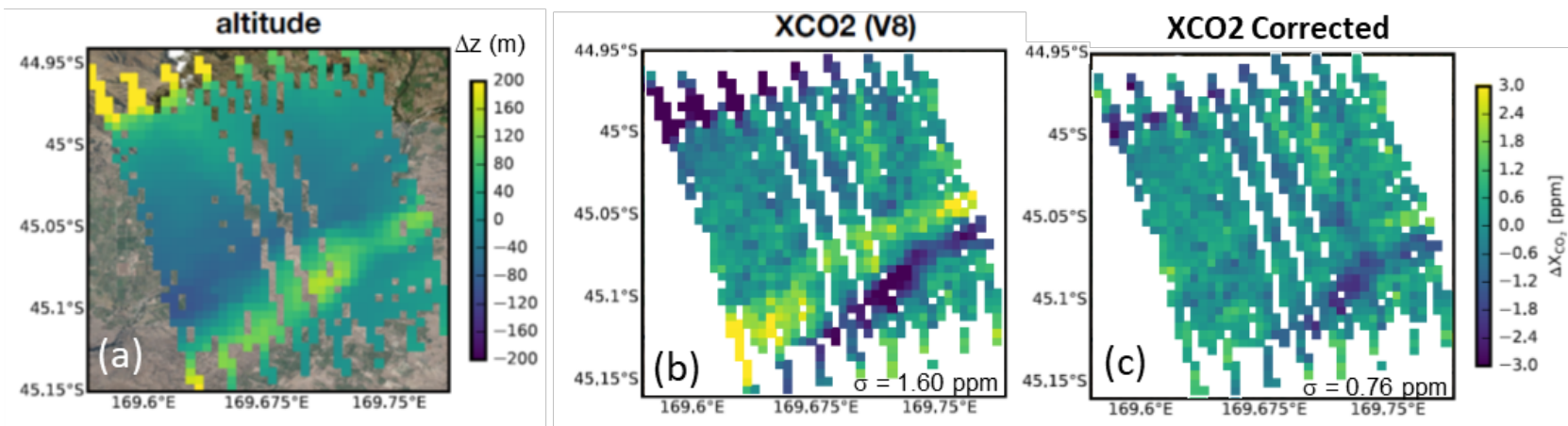
# Known Issues with the OCO-2 B8 Product

- Small ( $\sim 0.06^\circ$ ) Pointing/Geolocation errors introduces systematic biases in regions with significant topography
- A pole-to-pole surface pressure bias was introduced by the updated A-band gas absorption coefficients
- Comparisons with TCCON show a slight long-term drift in the  $X_{\text{CO}_2}$  product, losing 0.1-0.2 ppm/yr.
- Dark surface albedo screening is too aggressive



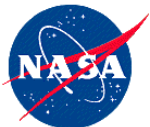


# The Pointing Offset



Matt Kiel and Paul Wennberg

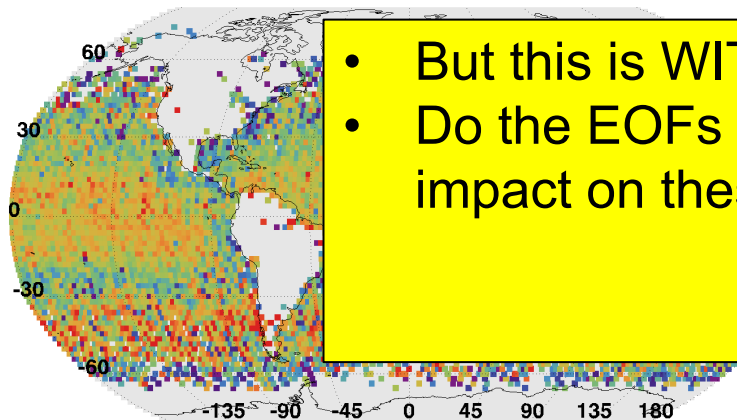
- OCO-2 observations of the Lauder TCCON station and other regions with moderate to large topographic variability show strong correlations between topographic slope and  $X_{CO_2}$  bias (b).
- These errors were traced to a small ( $0.06^\circ$ ) pointing error that was  $<1/6$  the angular size of the sounding footprint.
- Correcting the pointing error reduced by  $X_{CO_2}$  bias by more than half.
- See posters by Matt Kiel et al. (A51R-2501)



# Surface Pressure Bias due to Uncertainties in O<sub>2</sub> Absorption Cross Sections

V7 Baseline with  
Version 4.2 ABSCO

ABSCO Test 1 U-sign Set All screened data

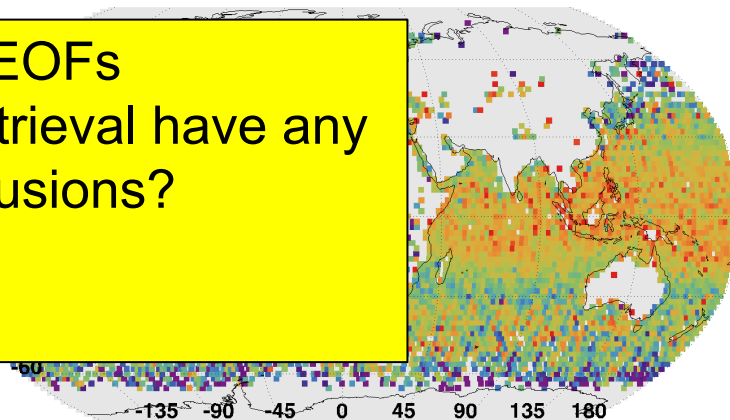


- But this is WITHOUT EOFs
- Do the EOFs in our retrieval have any impact on these conclusions?

→ YES!

V7 Baseline with  
Version 5.0 ABO2 ABSCO

ABSCO Test 3 U-sign Set All screened data



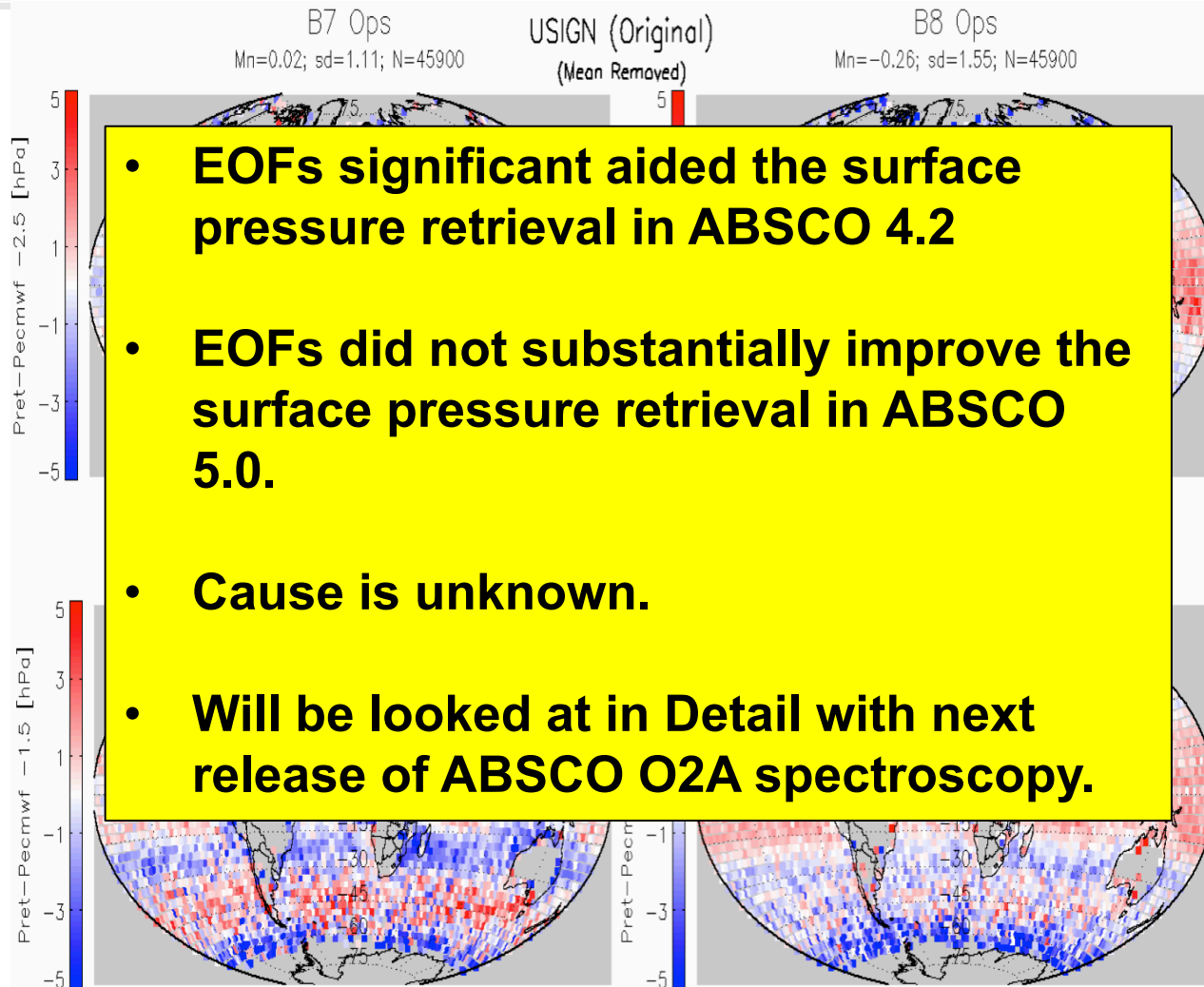
- Version 5 O<sub>2</sub> gas absorption coefficients (ABSCO, right) substantially reduced the amplitude of land/sea and ocean glint surface pressure biases and scatter seen in Version 4.2 ABSCO (left).
- However, it apparently introduced a larger, more coherent pole-to-pole bias.
- This difference is well compensated in the bias-corrected X<sub>CO2</sub> data included in the V8 Lite files.

Brendan Fisher and Vivienne Payne



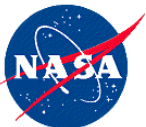


# Impact of EOFs on Surface Pressure Retrieval



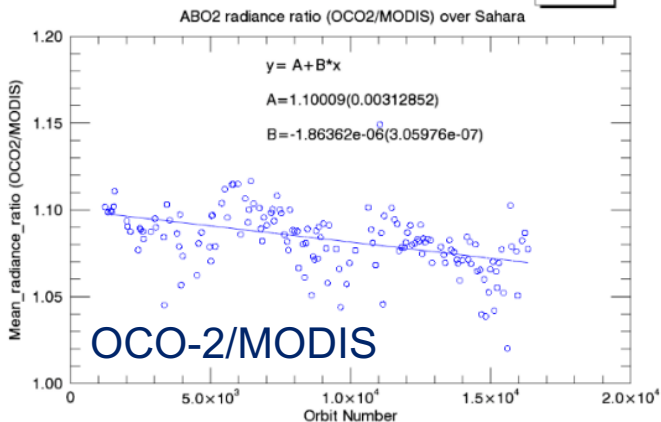
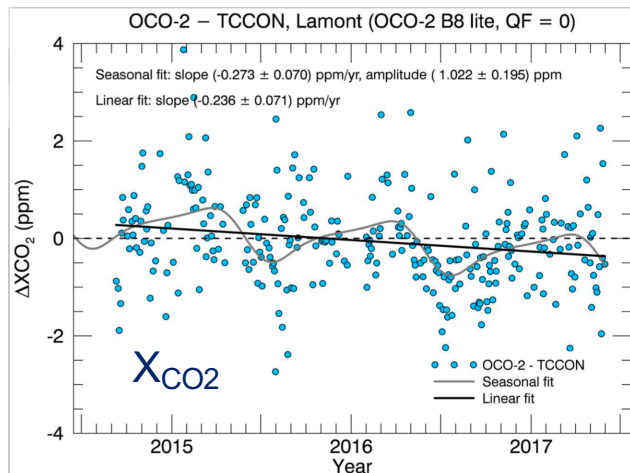
with  
EOFs

without  
EOFs



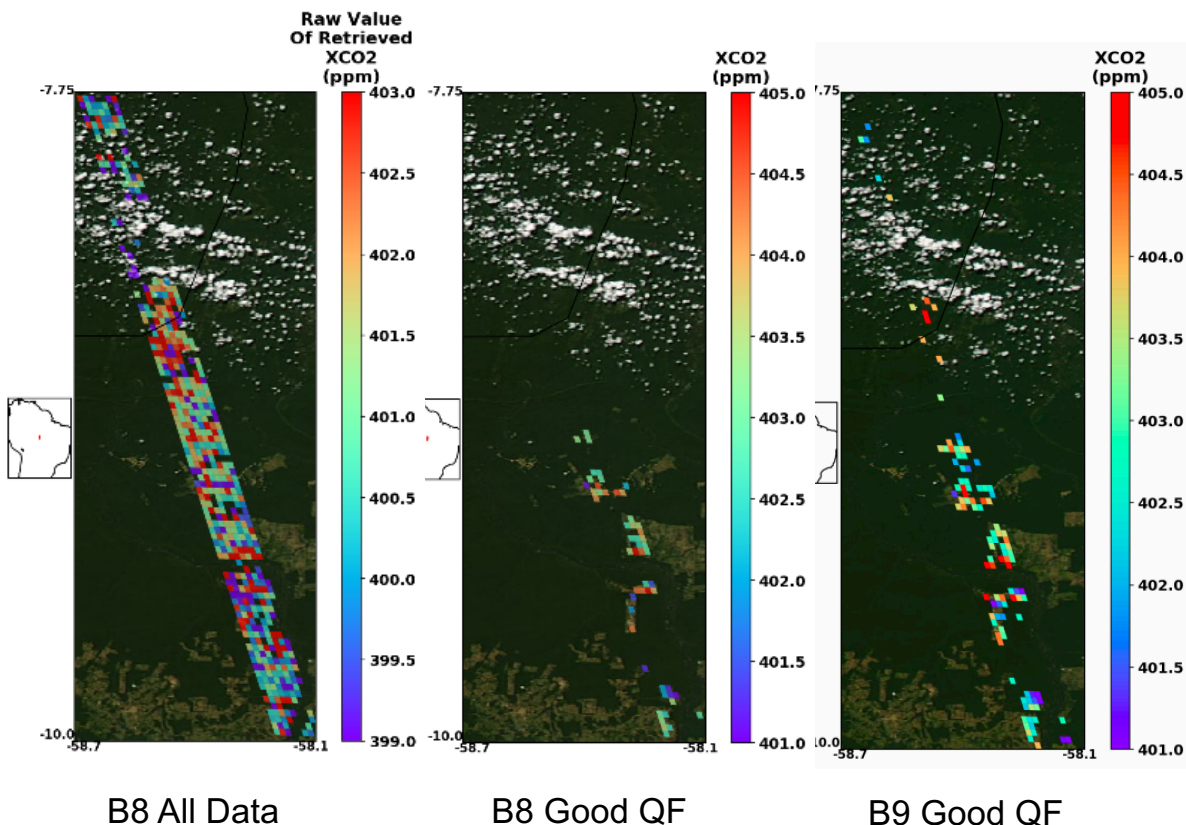
# Long Term Radiometric Drifts

- Comparisons of the OCO-2 V8 product with TCCON and Models indicate a long-term drift (-0.1 to -0.2 ppm/yr)
- This drift appears correlated with a long term drift in the radiometric calibration of the V8 L1b product
  - OCO-2 was cross calibrated against MODIS Aqua over the Sahara
    - Location box: 15° -23° N, 5° -17.5° E
  - Differences in viewing geometry (BRDF) and spectral interpolation may account for overall biases (based on RRV experience)
  - Comparisons indicate ABO2 (O<sub>2</sub> A-band) channel has a drift of -0.9% / year
- This drift will be corrected in the next build of the OCO-2 algorithm (B10)





# Why is the XCO<sub>2</sub> Yield so Low over Cloud-free Forests?

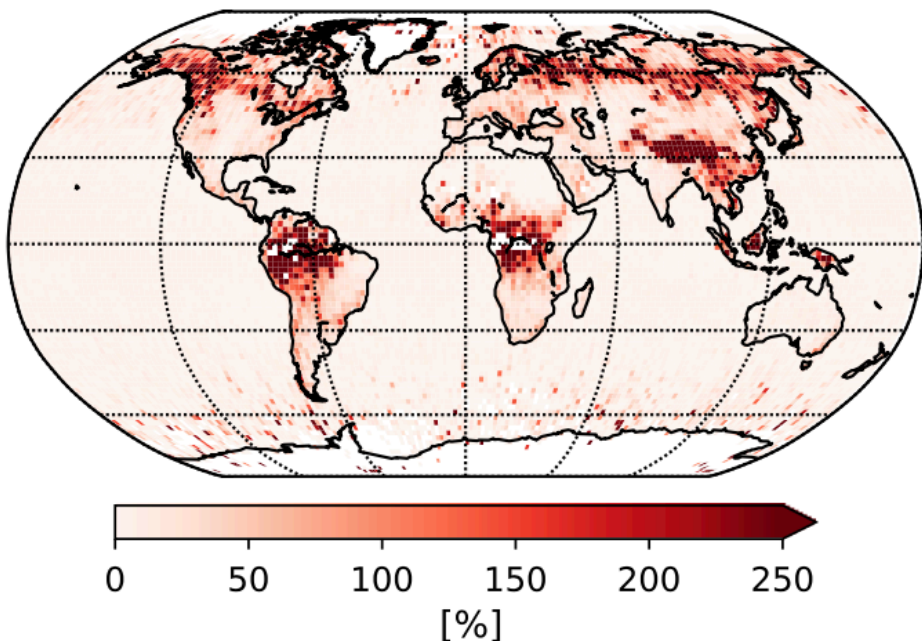


- Many cloud-free soundings are being lost over dark forests
- These soundings are being removed by the **strong CO<sub>2</sub> low albedo land filter**
- Many of these soundings can be recovered by adjusting this filter (at the possible expense of higher scatter)
- B9 fixed some of this, although still could use improvement.

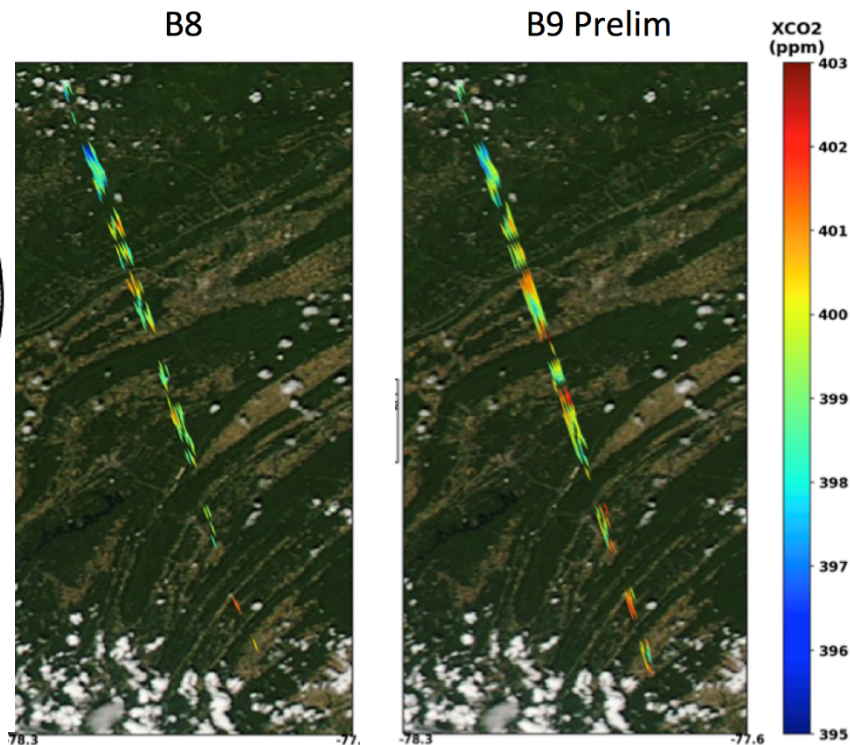




# Improved Yields



Matt Kiel et al., AMTD 2018



Emily Bell (CSU)

The pointing correction, combined with re-tuned quality filters improved the yield, especially in regions with rough topography and dark surfaces.



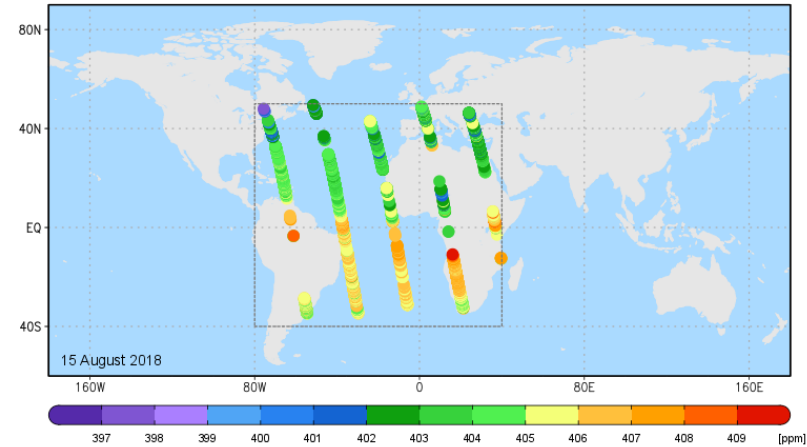
# Subsetting Capability Added for OCO-2 "Lite" Files

- OCO-2 and ACOS Level 2 "Lite" files can now be subsetting spatially and by variable
  - Spatial subsets may be selected within a bounding box or within a user-defined radius around a user-specified location ("point+radius subsetting")
- This service is now operational

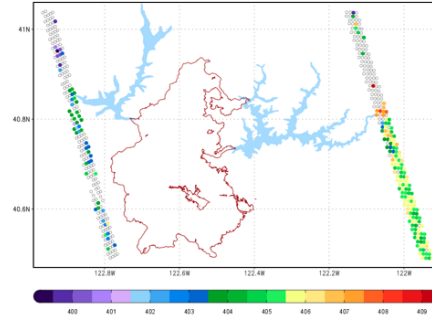
<https://disc.gsfc.nasa.gov/information/news?title=Subsetting%20capability%20added%20for%20OCO-2%20%22Lite%22%20files>

- Questions:
  - Dana Ostrenga, Thomas Hearty, Paul Huwe, Jennifer Adams, Andrey Savtchenko, Jerome Alfred, Lena Iredell

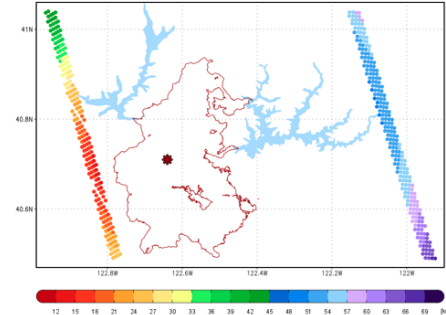
Column-Averaged Mole Fraction of CO<sub>2</sub>



CO<sub>2</sub> Measurements Near Carr Fire (13-15 August 2018)



OCO2 Swath Distance from Carr Fire Center (13-15 August 2018)



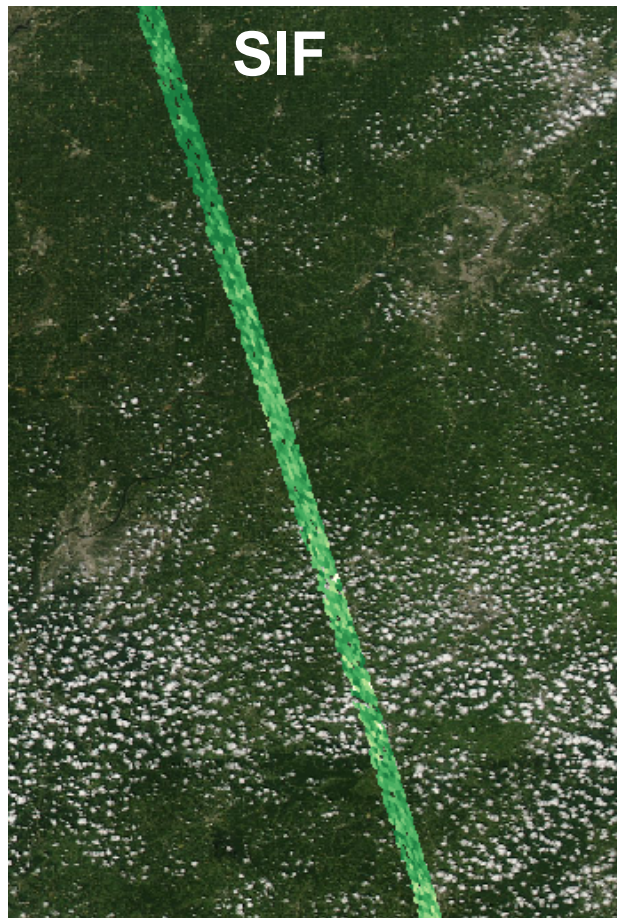
Left: XCO<sub>2</sub> for two OCO-2 orbits from 13 (left) and 18 Aug (right) that passed within 100 km of the Carr Fire.



# OCO-2 Data Coming to NASA's Worldview in Early 2019

- **Variables**

- Bias-corrected, Quality-filtered XCO<sub>2</sub>
- Bias-corrected, Quality-filtered XCO<sub>2</sub> with the NOAA ESRL daily global mean XCO<sub>2</sub> subtracted
- Total Column Water Vapor
- SIF at 757 nm
- SIF at 771 nm
- Blended SIF



OCO-2 overpass  
of the Ghent  
Generating  
Station in  
Kentucky on  
August 13, 2015

Worldview: <https://worldview.earthdata.nasa.gov/>

NOAA ESRL Daily Global Mean XCO<sub>2</sub>:

[ftp://aftp.cmdl.noaa.gov/products/trends/co2/co2\\_trend\\_gl.txt](ftp://aftp.cmdl.noaa.gov/products/trends/co2/co2_trend_gl.txt)





# On to Version 10

- Known changes:
  - Fix small bugs (IMAP preprocessor affects cloud screening fidelity)
  - Fully implement met resampler fix
  - Updated O<sub>2</sub>A-band spectroscopy (with hopes to improve the surface pressure retrieval)
- Items being explored:
  - Time Trend in XCO<sub>2</sub> data ( $\sim -0.1$  to  $-0.3$  ppm/yr). Cause? How to fix?
  - Surface pressure prior constraint.
  - Aerosol scheme. (Nelson's new scheme? Other?)
  - Better merging of quality flag and warn levels.
  - Many others: radiance offsets, SIF treatment in L2, solar continuum model, quadratic albedo fit, better posterior uncertainty, co<sub>2</sub> prior constraint, 3D cloud correction.
- Expected completion time frame: Summer 2019???

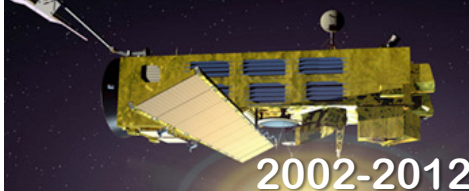




# Retrieval Improvements may impact all these present and future satellites

PAST

**EnviSat SCHIAMACHY**



2002-2012

PRESENT

**GOSAT**



2009 ...

**OCO-2**



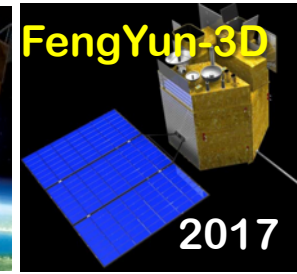
2014 ...

**TanSAT**



2016 ...

**FengYun-3D**



2017

NEAR FUTURE

**GOSAT-2**

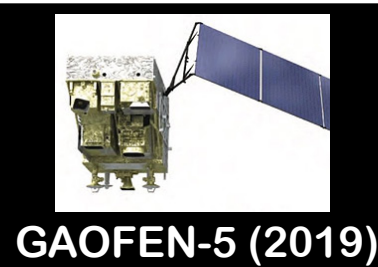


2019

**OCO-3/ISS**



2019



**GAOFEN-5 (2019)**

LATER

**MicroCarb**



2020

**GeoCarb**



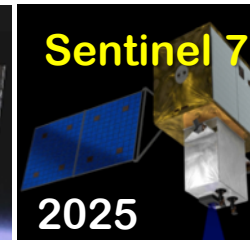
2022

**GOSAT-3**



2023

**Sentinel 7**



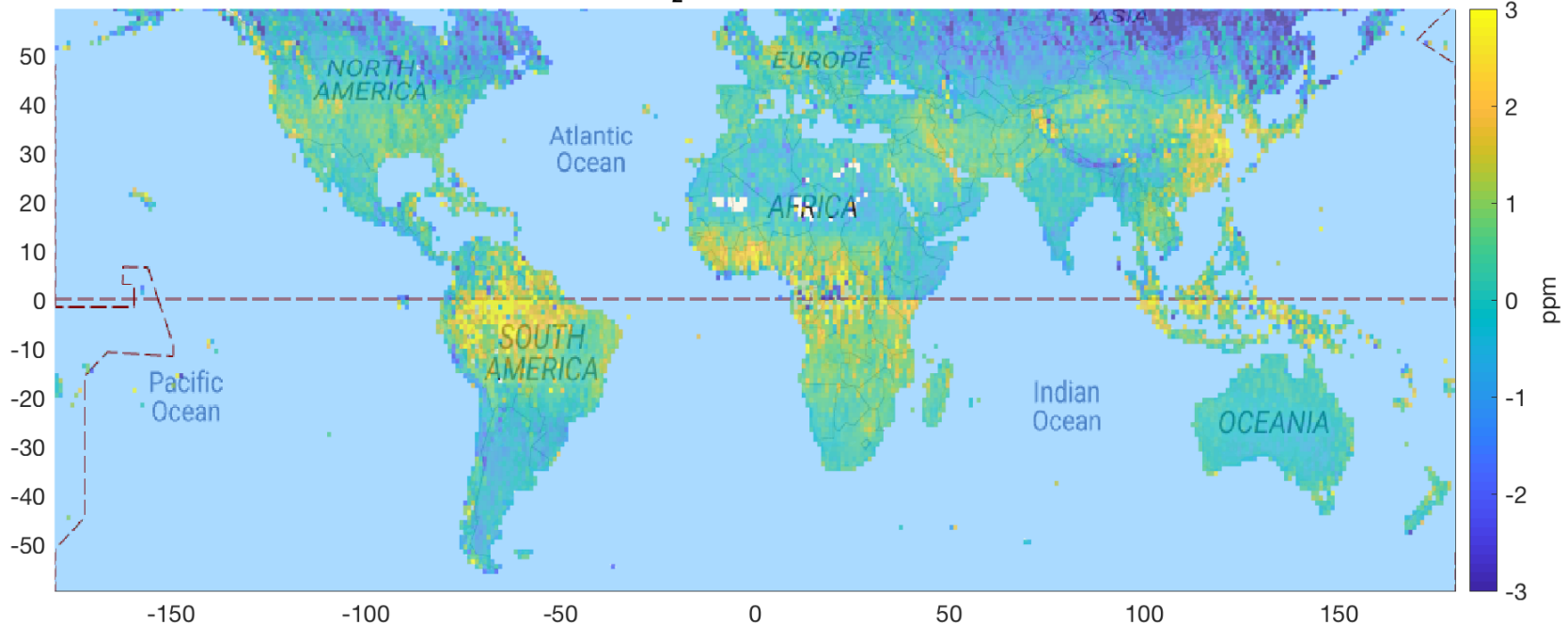
2025



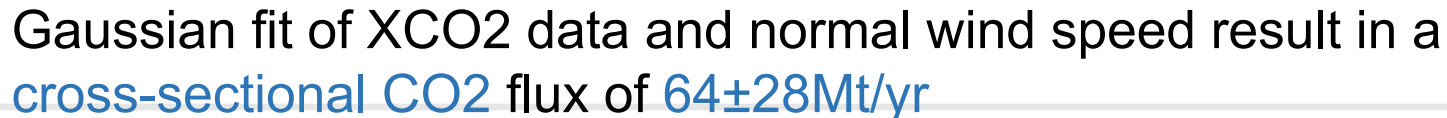
# Persistent $X_{CO_2}$ Anomalies (Hakkarainen et al.)

## Comparison of the V8 and V9 Products

OCO-2  $X_{CO_2}$  anomalies, V9, 2015-2017

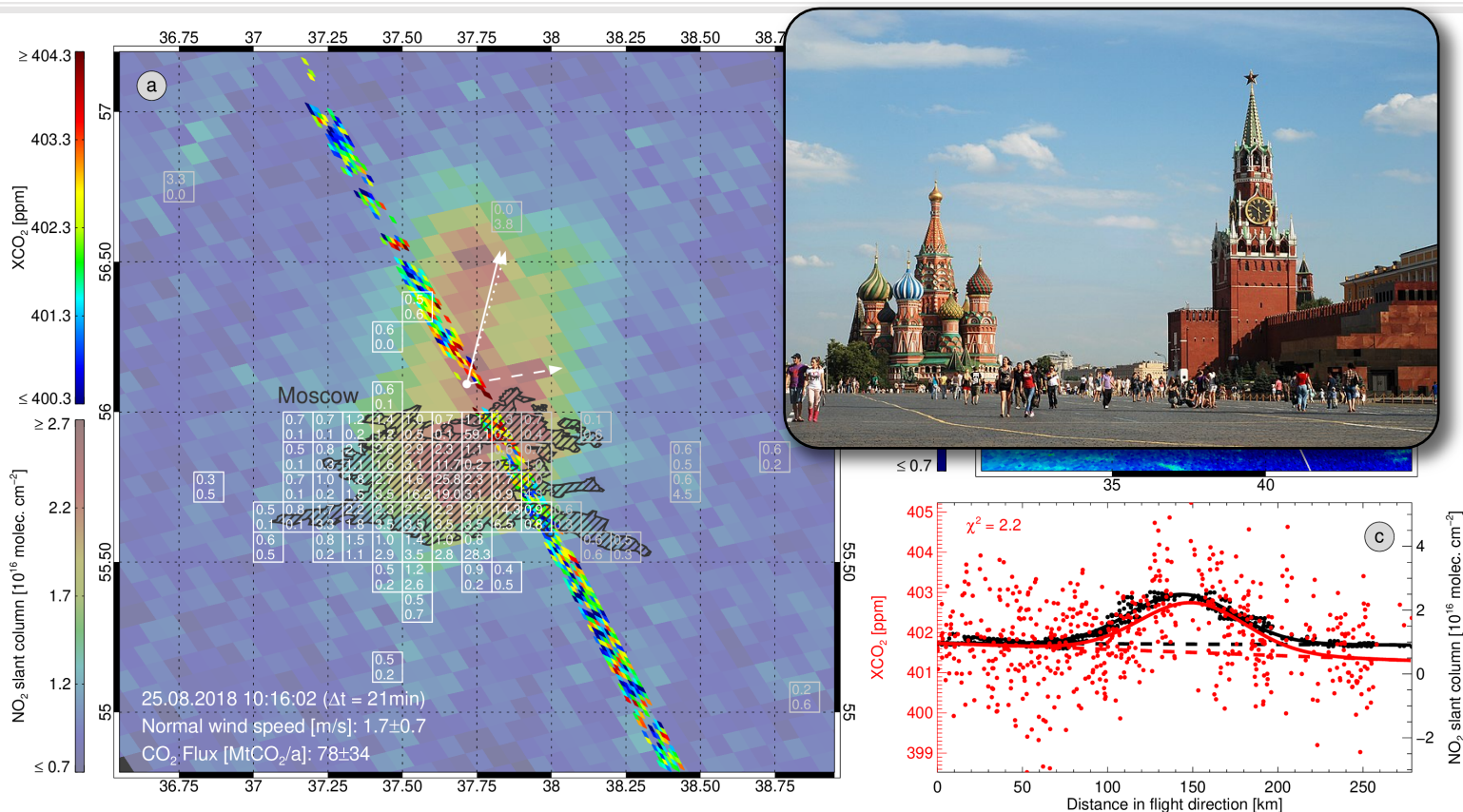


- OCO-2  $X_{CO_2}$  estimates are being used to quantify persistent anomalies associated with  $CO_2$  emissions (sources) and uptake (sinks) [Hakkarainen et al. *Atm. Chem. Phys.* 2018]
- While the V8 and V9 anomalies are similar, the V9 product has much less scatter in areas with rough topography (i.e. Himalayas, Canadian Rockies)





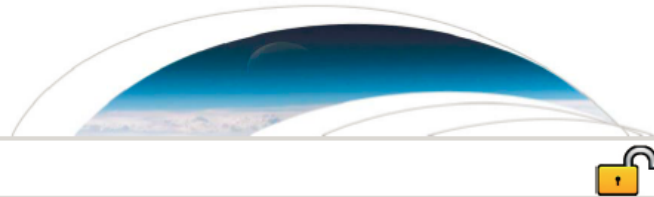
# Point source flux estimates using combined OCO-2 XCO<sub>2</sub> and S5P NO<sub>2</sub> (Reuter et al., ACP, in prep)



XCO<sub>2</sub> enhancement; NO<sub>2</sub> enhancement, emissions databases not sure.

Gaussian fit of XCO<sub>2</sub> data and normal wind speed result in a cross-sectional CO<sub>2</sub> flux of  $64 \pm 28 \text{ Mt/yr}$  for Moscow.





RESEARCH LETTER

10.1002/2017GL074702

Key Points:

- The combustion of coal for electricity generation accounts for more than 40% of global anthropogenic CO<sub>2</sub> emissions
- Orbiting Carbon Observatory 2 observations can be used to quantify CO<sub>2</sub> emissions from individual coal power plants, in selected cases
- This work suggests that a future constellation of CO<sub>2</sub> imaging satellites could monitor fossil fuel power plant CO<sub>2</sub> emissions to support climate policy

Supporting Information:

- Supporting Information S1

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Quantifying CO<sub>2</sub> Emissions From Individual Power Plants From Space

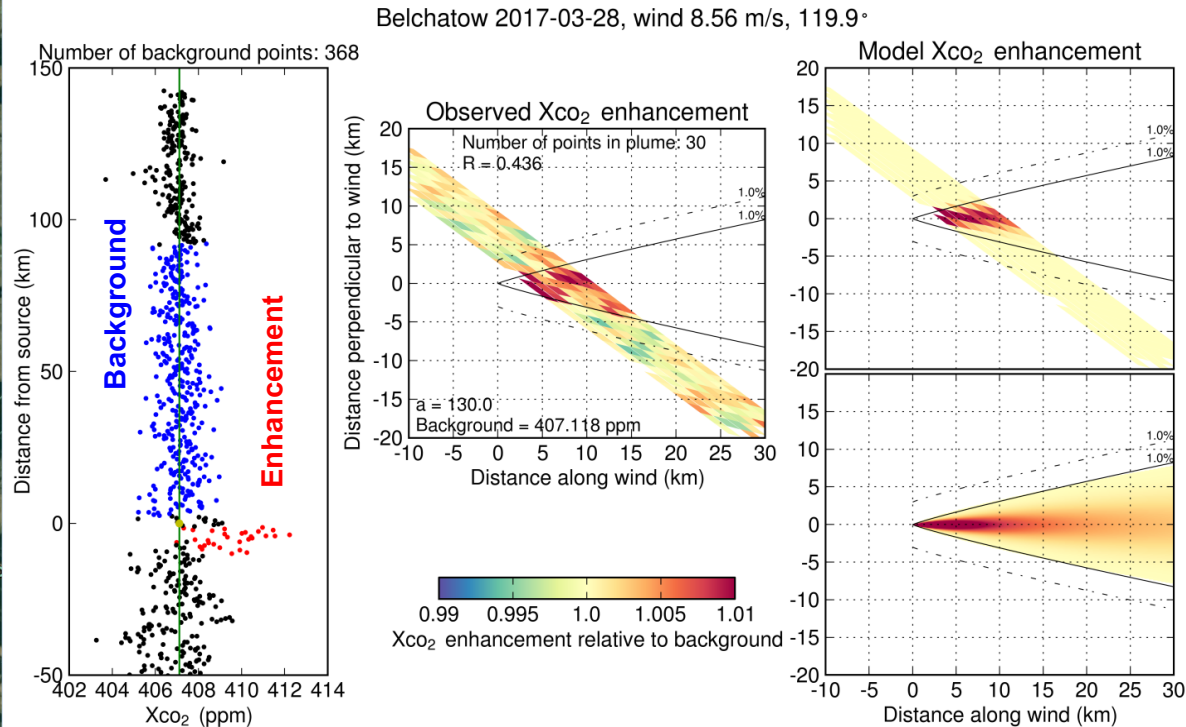
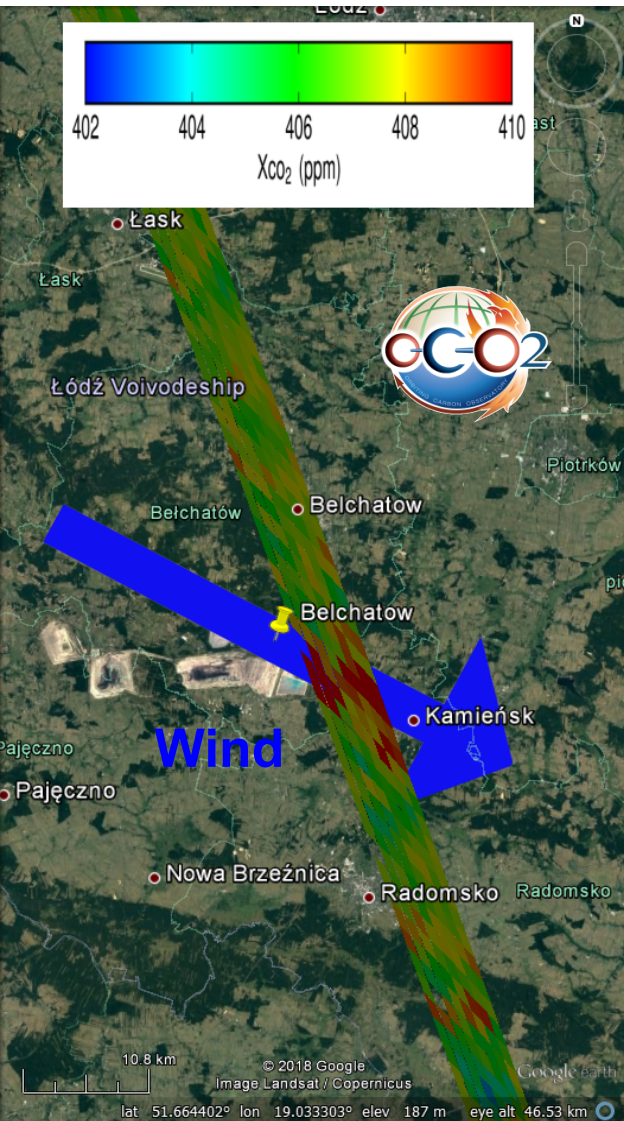
Ray Nassar<sup>1</sup> , Timothy G. Hill<sup>2</sup> , Chris A. McLinden<sup>3</sup> , Debra Wunch<sup>4</sup> , Dylan B. A. Jones<sup>4</sup> , and David Crisp<sup>5</sup>

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**Abstract** In order to better manage anthropogenic CO<sub>2</sub> emissions, improved methods of quantifying emissions are needed at all spatial scales from the national level down to the facility level. Although the Orbiting Carbon Observatory 2 (OCO-2) satellite was not designed for monitoring power plant emissions, we show that in some cases, CO<sub>2</sub> observations from OCO-2 can be used to quantify daily CO<sub>2</sub> emissions from individual middle- to large-sized coal power plants by fitting the data to plume model simulations. Emission estimates for U.S. power plants are within 1–17% of reported daily emission values, enabling application of the approach to international sites that lack detailed emission information. This affirms that a constellation of future CO<sub>2</sub> imaging satellites, optimized for point sources, could monitor emissions from individual power plants to support the implementation of climate policies.

# Europe's Largest Power Plant: Bełchatów in coal region of Poland, in close proximity to COP24



**Preliminary v9 CO<sub>2</sub> Emission Estimate: 89.6±21.6 ktCO<sub>2</sub>/day**

**Error budget: wind speed uncertainty: ±2.6 kt/day**

**background uncertainty: ±1.3 kt/day**

**enhancement uncertainty: ±21.3 kt/day**

Reported annual values converted to daily emissions:  
CARMA for 2009 (72.3 kt/day), European Commission for 2013 (102 kt/day)

**Ray Nassar, Callum McCracken, Cameron MacDonald, Matt Kiel**



# Call for Contributions to a Special Issue on Remote Sensing of CO<sub>2</sub> and CH<sub>4</sub>



*remote sensing*

IMPACT  
FACTOR  
3.406

## *Special Issue*

### Remote Sensing of Carbon Dioxide and Methane in Earth's Atmosphere

#### *Special Issue Editor:*

**Dr. Prabir K. Patra**

Japan Agency for Marine-Earth Science and Technology

**Dr. David Crisp**

Jet Propulsion Laboratory, California Institute of Technology

**Dr. Thomas Lauvaux**

Pennsylvania State University

**Website:** [www.mdpi.com/si/18603](http://www.mdpi.com/si/18603)

**Submission Deadline:** 31 May 2019

Carbon dioxide (CO<sub>2</sub>) and methane (CH<sub>4</sub>) are the two most important greenhouse gases that have led to a significant fraction of the increase in earth's surface temperature in the past 100 years. This Special is dedicated to the past progress and new developments in satellite remote sensing of long-lived greenhouse gases, with a focus on CO and CH<sub>4</sub>.



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